



DATA FLOW CONSIDERATIONS IN IMPLEMENTING

ON THE CRAY-1

A FULL MATRIX SOLVER WITH BACKING STORE

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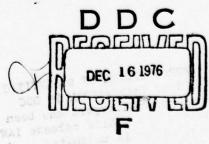
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#### Abstract

Techniques for the solution of full systems of simultaneous equations represent an important algorithm class for vector processors. This report considers the data flows involved in solving a full equation system on the Cray-1. This involves study of the I/O and memory-processor path traffic vis-a-vis the capabilities of the Cray-1 to support it. The I/O is found to present problems for small systems of equations and in the substitution phases of small and large systems. Using an algorithm proposed in the report, the memory-processor path is shown to have excess bandwidth. Suggestions are made for utilizing this bandwidth to increase the arithmetic operation rate by modifying and expanding the processor architecture.

| Contents  | Page                             |
|---|----------------------------------|
| I. Introduction   | 1                                |
| <ul> <li>II. Evaluation of the I/O bandwidth</li> <li>A. Introduction</li> <li>B. Small matrices initially on backing store</li> <li>C. Large full matrices</li> <li>D. The I/O problem in the substitution process</li> </ul>                          | 3<br>3<br>4<br>6                 |
| III. Evaluation of the Processor-Memory Path A. LU factorization B. A reduced data flow algorithm C. Row block reduction D. Accounting for memory access reduction E. Algorithm implementation on the Cray-1  | 8<br>10<br>13<br>15<br>16        |
| A. Further algorithmic considerations B. Speedup by architectural modifications 1. Introduction 2. Register control 3. Expanded functional units 4. Scalar register chaining  *References  **References**  **References**  **References**  **Production | 24<br>24<br>25<br>25<br>27<br>28 |

#### I. Introduction

The communication links between the major components of the Cray 1 system - the processor, main memory, and mass memory devices (backing store) - are the architectural features most critical to algorithmic development after the vectorization feature itself. Only a single data path exists between memory and processor, so that even though the 16-way interleaved memory has capacity to transfer words at four times the clock speed, only ¼ of this speed is available to the processor. This leaves potenetially 3/4 of the memory bandwidth (i.e., 240 megawords/sec.) for I/O. However, the I/O channels have capacity for only 12.9 megawords/sec. when operating with a full complement of 24 discs. The potential for a communications bottleneck on both sides of memory is therefore significant.

One can claim that in fact a three-level memory heirarchy exists, by viewing the vector register set as functionally a single or dual cache. However, the register and functional unit speeds are matched, so that no communication problem exists at this end of the memory heirarchy.

Algorithmic remedies for these communication problems are of the general philosophy that computational complexity should be maximized on data at each memory level. If the total arithmetic complexity is independent of data organization in the memory levels, this strategy insures that the fewest data movements are required when maximum computational use is made of data at each level. Practically, this procedure involves vector and small matrix operations like inner- and outer- products on data in the

register cache before sending the result to main memory, and large matrix operations on data in main memory before communication with backing store.

This study will be concerned with examining the data flows associated with solution of a full set of linear simultaneous equations. It happens that, in movement and operations with large data blocks, programming effort is increased to handle incomplete blocks and intrablock computation (e.g., the movement across the pivot elements in sweeping through a column strip of a matrix). However, the major communication problems can be studied by examining two critical loops in an equation solution algorithm:

(1) the outermost loop, where megaword blocks are moved between the backing store and main memory to satisfy the gross needs of the functional units on the other side of memory for operands and to store results, and (2) the innermost multiplication-subtraction loop in the solution, where the memory-to-register flow is critical.

Before proceeding, it should be noted that in investigating methods to reduce the impact of an apparent data flow bottleneck, we will not only remove the flow constriction but have in one case by algorithmic means exposed excess flow capacity. This in turn suggests that additional functional unit capacity could be accommodated - either through parallelism or faster pipelines. If similar results could be obtained for a sufficient number of major applications, this would indicate that future architectural redesign and expansion be directed toward the functional units rather than the data paths, heretofore felt to be the most critical architectural feature.

#### II. Evaluation of the I/O Bandwidth

#### A. Introduction

It is easy to show that a Cray-1 is capable of solving a large system of n linear simultaneous equations in approximately 4.8n<sup>3</sup> nanoseconds, including a 10 clock overhead in the innermost loop to divide long vectors into ones of length 64. A system with an 8 megabyte main memory can consequently solve 1000 equations - filling main memory - in 4.8 seconds. Thus, an equation set worthy of vector processing inevitably involves use of a backing store.

Smaller full matrices are often encountered as part of larger sparse matrix solution; these full components reside on a backing store, are loaded at appropriate times during the overall solution process, and undergo a sequence of computations similar to the factorization of a single full matrix. Such matrices are typically in the order of  $20 \le n \le 100$ .

The backing store itself can consist of between 1 and 12 disc units on both input and output, each capable of a transfer rate of 34.5 megabits. This yields a total input capacity of .54-6.48 megawords/second. In the following sections, we will establish that this rate can be inadequate to support the gross computational needs of the arithmetic fuctional units both for small and for very large sets of simultaneous equations, but is adequate for many typical matrix problems of intermediate size.

# B. Small matrices initially on backing store

To read a matrix of dimension n with m input channels from backing store requires 1.85  $n^2/m$   $\mu s$ . This becomes equal to the

solution time  $(4.8n^3 \text{ ns})$  when n=385/m or n=32 for full input channel capacity. For smaller values of n, the processor will be busied nm/385 of the time, a some what alarming result for the range  $20 \le n \le 100$ , even with full channel activation.

### C. Large full matrices

In the LU triangular factorization of a matrix too large to be contained in real memory, it becomes necessary to recall from backing store factored parts of the matrix to participate in operations on a part of the matrix currently being factored. For the sake of discussion, it will be assumed that the matrix is partitioned into column strips, so that factorization takes place on a strip currently in main memory by recalling previously-factored strips.

As an example, in Figure 1, a full matrix of size n (=6) is divided into k partitions of storage  $S_k$ , each having p = n/k columns. The number of writes to backing store is  $n^2$ , assuming that the entire factored matrix must reside on backing store. The number of reads is

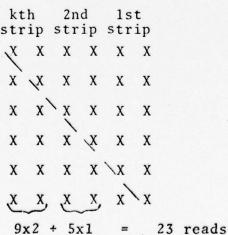


Figure 1. Counting reads in a factorization

$$N_{r} = \frac{\sum_{r=1}^{k-1} \frac{p(p-1)}{2} r + p^{2}(k-r)^{2}}{2}$$

$$= \frac{p(p-1)(k-1)(k)}{4} + \frac{p^{2}(k-1)(k)(k-1/2)}{3}$$
(1)

With total storage S and strip size  $S_k$ , then  $k = S/S_k$  and  $p = S_k/\sqrt{S_*}$ . The second term of (1) easily dominates the expression, and this dominant term can be written\*

$$N_r \approx \frac{S^2}{3S_k} = \frac{p^2 k^3}{3}$$
 (2)

With half of main memory devoted to the current and the recalled strips, the fraction  $\sigma$  = (computation time)/(I/0 time) can be computed from (2) as

$$\sigma = \frac{3.9 \times 10^3 \text{m}}{\text{n}}$$

Thus, a single disc could supply operands up to n = 3900, which requires 4.7 minutes of computation time. This appears more than adequate I/O bandwidth.

<sup>\*</sup>Equation (2) also applies to a large class of sparse equations [2].

### D. The I/O problem in the substitution process

The I/O problem is proportionally more severe for the forward and back substitution steps, where only a few numeric computations are performed with each element of the recalled factored matrix.

Consider an arithmetic computation sequence where K arithmetic computations are performed on the average on every L words in main memory, by a processor with an operation rate of M floating point operations/second (FLOPS). Then the memory must be supplied from the backing store at the rate of

In the forward and back substitution stages, the inner loop instruction will be of the general form

$$X(I) = X(I) - LU(J)*YD$$
 (4)

where LU(J) contains the elements of  $\underline{L}$  and  $\underline{U}$ . Each such element is used a single time in the two substitutions, so that (ignoring array X and scalar YD) L=1 and K=2 in (3). If the LU array is on backing store, then this store is required to supply operands for (4) at M/2 words/sec.

This is a prohibitive rate, as evidenced by calculation of

 $\gamma$  = (arithmetic computation time)/(I/0 time)

(chained multiply-subtract time)/(word transfer time)

 $\approx 12.5 \times 10^{-9} \text{m}/1.85 \times 10^{-6}$ 

≃ .0068m

Thus, the processor will be busied less than 1 percent of the time with a single disc control, and less than 10% with full input channel activation.

This is a well-known problem in the solution of systems that cannot be contained in main memory; because of the Cray-1 processor

speed, it is simply aggravated. It is an interesting aspect of the problem that for the general class of sparse/full matrices, the above ratio is independent of matrix size, density, or equation ordering.

# III. Evaluation of Processor-Memory Path

#### A. LU factorization

The data flow between the memory and processor is associated with the inner loops of the triangular factorization process.

As a result, it becomes necessary to consider notation and details related to the LU factorization.

Let the matrix A be factored into

$$\underline{A} = \underline{L} \underline{U}$$

where

$$\underline{L} = \begin{bmatrix} 1 & 0 & 0 & \dots & 0 \\ 2_{21}^{1} & 0 & \dots & 0 \\ 2_{21}^{1} & 0 & \dots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ n_{1}^{l} n_{2} & \dots & 1 \end{bmatrix}, \quad \underline{U} = \begin{bmatrix} u_{11} & u_{12} & u_{13} & \dots & u_{1n} \\ 0 & u_{22} & u_{23} & \dots & u_{2n} \\ 0 & 0 & u_{33} & \vdots & \vdots \\ 0 & 0 & \dots & u_{nn} \end{bmatrix}$$
(5)

One method of performing this decomposition on the Cray 1 was given in [2] and will be termed the inner product algorithm. It is described as follows.

At the  $k^{th}$  pivot step, assume that the  $u_{ij}$  has been computed for  $1 \le i \le k-1$ ,  $i \le j \le n$ , and that  $\ell_{ij}$  have been formed for  $1 \le j \le k-1$ ,  $j+1 \le i \le n$ .

Then we calculate

$$\frac{100p(1)}{k-1} \qquad \frac{100p(2)}{m-1}$$

$$\hat{\ell}_{ik} = a_{ik} - \sum_{m=1}^{\infty} \ell_{im} u_{mk} \qquad i = k+1,...n$$
(6)

$$u_{kj} = a_{kj} - \sum_{m=1}^{l} \ell_{km} u_{mj} \qquad j = k, \dots n$$

$$(7)$$

$$l_{ik} = \hat{l}_{ik} / u_{kk} \qquad \qquad i = k + 1, \dots n \qquad (8)$$

where the loops are indicated in Figure 2. The inner product description follows from loops 1 and 3 above.

The inner product method requires accessing along both rows and columns and as such it may be necessary to skew the matrix in memory so that successive accesses are not made from the same memory bank.

The loop ① portion of the inner product inner loop was implemented on the Cray-1 by loading into a vector register a portion of a row,  $u_{1,m}$ ,  $k \le m \le k+63$ . This load was chained to a vector multiply involving  $\ell_{k,1}$ . The product was then chained to a vector subtract from the pre-fetched matrix elements  $a_{k,m}$ ,  $k \le m \le k+63$ . This continued with

$$a_{k,m} = a_{k,m} - \ell_{k,2} + u_{2,m}$$
  $k \le m \le k + 63$  (9)

$$a_{k,m} = a_{k,m} - \ell_{k,k-1} *^{u_{k-1,m}} \quad k \leq m \leq k+63$$
 (10)

As can be seen, the u elements that participated in the vector multiply were streaming from main memory into the multiply pipe-line with final accumulation through the subtract pipeline. In this way up to 64 inner products are computed concurrently. The L elements were computed similarly.

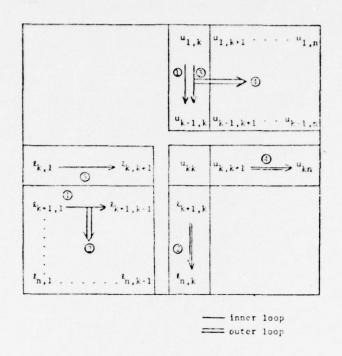


Figure 2. k<sup>th</sup> pivot inner product calculation

In processing a matrix that is too large to be contained in main memory, there will be no time available for the I/O system to access memory while the inner loop is executing. As a result, the arithmetic and I/O operations cannot be concurrent and the factorization is slowed.

# B. A reduced data flow algorithm

The alternative algorithm this report explores is based on a technique due to Pavkovich [3]. This algorithm employs the vector registers in such a way so as to reduce memory references to about 20% of what was required in the algorithm described above. This is accomplished by completing five rows of the matrix for each multiplicative use of a U vector rather than completing only a single row. This should leave the I/O system sufficient memory access time to allow the movement of portions of the matrix to and from the disk without slowing the functional units.

The arithmetic computation for this algorithm is numerically identical to what was described above. The sequence of operations is changed with the effect being a block-wise reduction of the matrix. With reference to Figure 3, the following sequence is performed at the  $k^{\mbox{th}}$  block step.

- 1) Reduce the q x q diagonal block comprising elements  $a_{i,j}$ ,  $k \le i \le k+q-1$ ,  $k \le j \le k+q-1$ .
- 2) Reduce the q x p row blocks. The last row block may have fewer than p column elements.
- 3) Reduce the p x q column blocks. The last column block may have fewer than p row elements.
- 4) Repeat steps 1-3 with the remaining k-q x k-q sub-matrix.
- 5) The factorization will be complete with the reduction of the south-east corner diagonal block. This block may have fewer than q row and column elements.

For the present, only the reduction of the  $q \times p$  row blocks and the  $p \times q$  column blocks will be discussed.

The structure of the off-diagonal blocks and the matrix traversal scheme was chosen with the algorithm's implementation on the Cray-1 in mind. In this way one is always dealing with full length vectors except at a row or column end. The detail of a row block appears in Figure 4.

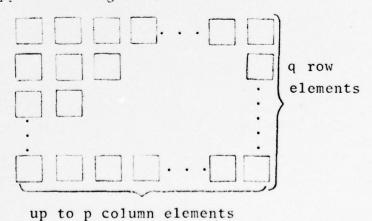


Figure 4. Row block detail

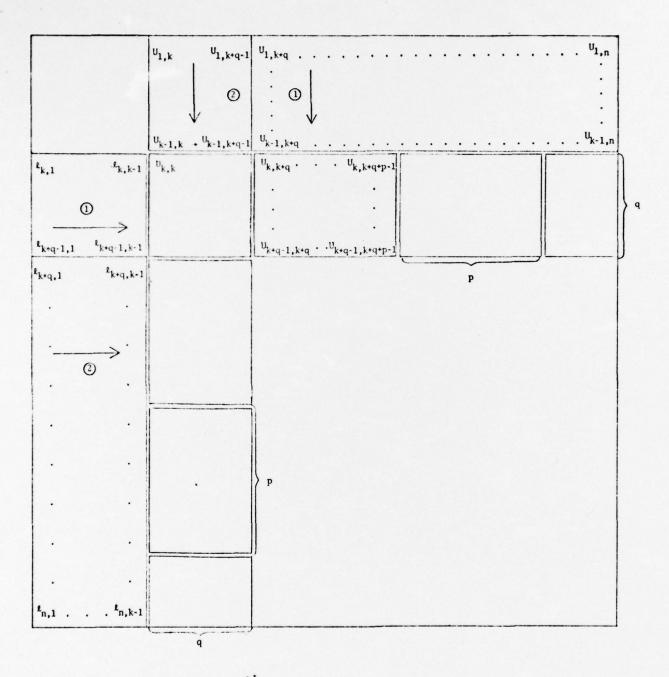


Figure 3. K<sup>th</sup> pivot step block reduction.

#### C. Row block reduction

This block is read from memory into the vector registers of the Cray-1. As a result, the limitation on p is 64 column elements, this being the number of storage locations in a vector register. With eight vector registers available, three of which are used to perform the inner product calculation, q has the value of five.

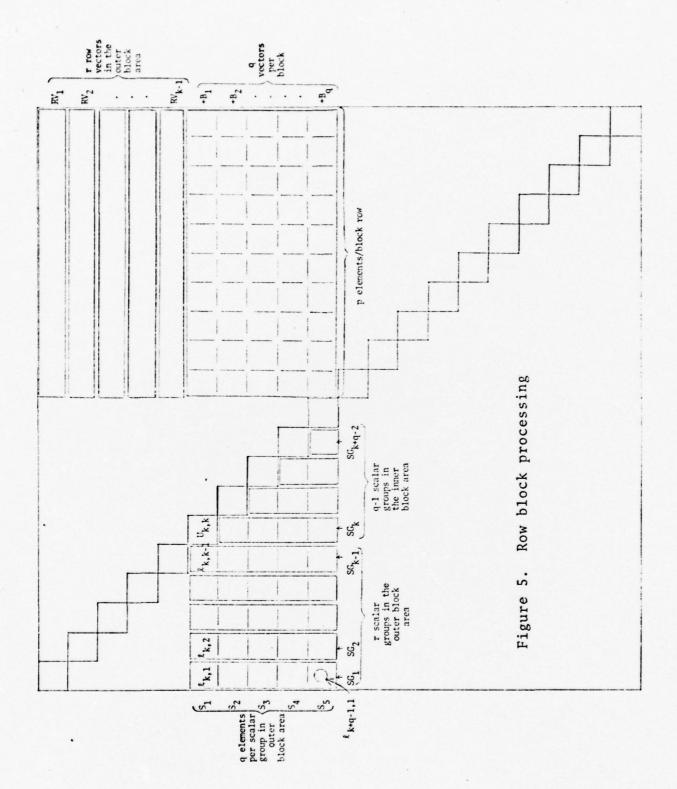
The processing of a typical row block proceeds as follows. First the q x p block to be reduced is loaded into the q vector registers set aside for that purpose. These vector registers will be denoted  $\overline{B}_1$  to  $\overline{B}_q$ . The inner loop operation sequence is carried out for  $1 \le i \le k-1$  (see Figure 5).

- 1) Load RV; into the row vector register,  $\vec{V}_{rv}$ .
- 2) Load SG<sub>i</sub> into the scalar group registers,  $S_i$ ,  $1 \le j \le q$ .
- 3) With the data now present in registers, q computation sequences can be carried out. Each computation sequence is of the form

$$\overline{B}_{m} = \overline{B}_{m} - S_{m} \times \overline{V}_{rv}$$
,  $1 \le m \le q$ .

The computation represented by this equation is performed element by element on each of the p components of the vector register.

This completes all computation external to the reduction block. Consequently, only the  $\overline{\mathbb{B}}_1$  block vector is completely reduced, with  $\overline{\mathbb{B}}_2$  ...  $\overline{\mathbb{B}}_q$  not yet finished. The reduction is completed by using reduced  $\overline{\mathbb{B}}$  vectors internal to the block to reduce the balance of the block.



The following sequence is carried out for  $1 \le i \le q-1$  to complete the block reduction.

- 1) Load  $SG_{k+i-1}$  into the scalar group registers,  $S_j$ ,  $i+1 \le j \le q$ .
- 2) With the data now present in registers, q-1 computation sequences can be done. Each computation sequence is of the form

$$\overline{B}_{m} = \overline{B}_{m} - S_{m} \times \overline{B}_{i}$$
,  $i+1 \le m \le q$ .

At the i<sup>th</sup> completion of this sequence,  $\overline{B}_{i+1}$  is fully reduced and can be returned to memory and also used to complete the remaining  $\overline{B}$  vectors.

# D. Accounting for memory access reduction

To justify the claim that main memory accesses are reduced using this algorithm it is necessary to determine the ratio ( $\rho$ ) of multiplies (additions are essentially free) to main memory accesses. Table 1 delineates the quantities involved. The quantity r is the number of row vectors external to the reduction block. The ratio is then

$$\rho = \frac{q/2(q+2r-1)p}{q/2(q+2r-1)+(r+2q)p}$$
 arithmetic operations memory accesses

Scalar fetches:  $qr + \frac{q(q-1)}{2}$ 

Vector element fetches: (r+q)p

Vector element stores: qp

Multiplies required:  $[qr + \frac{q(q-1)}{2}]p$ 

Table 1. Ratio quantities

The number of multiplies necessary is essentially a function of the number of scalars involved, which is primarily a function of r since q is fixed in the implementation. Asymptotically, this ratio becomes

$$\rho_{a} = \lim_{r \to \infty} \rho = \frac{qp}{q+p} \quad \text{operations/access}$$

Also note that as p, which is the vector register length, increases  $\lim_{a} = \text{q operations/access}$  p  $\rightarrow \infty$ 

we asymptotically can achieve no better than q arithmetic operations per memory access, indicating that longer vector registers would not improve this aspect of the algorithm.

Using values for q=5 and p=64 as in the Cray-1 implementation, the asymptotic performance is p=4.63. As the vector register length increases the effect of the q scalar loads diminishes and p asymptotes to 5 operations/(memory access).

Contrasted with q=1 and p=64 used in the original inner product algorithm where  $\rho$ =.984 operations/(memory access), the improved algorithm yields a 78.7% reduction in memory accesses.

# E. Algorithm implementation on the Cray-1

The data flow of the inner loop, which performs the block reduction, is quite straight forward. Figure 6a illustrates the data flow through the vector registers as the processing, external to the block, is carried out.

The physical vector registers in the Cray-1 are assigned names V0 through V7. The contents of each vector register has been assigned a label with an overbar indicating what is currently stored there, (i.e.,  $\overline{B}_1$  through  $\overline{B}_5$  refer to the five vectors comprising the reduction block,  $\overline{RV}_i$  refers to the ith row vector residing in a vector register, etc).

| *                  | *               | \    | *                 |     |                   |   |
|--------------------|-----------------|------|-------------------|-----|-------------------|---|
| *> vo              | PV              | V0   | PV                | VO  | PV                |   |
| $M \rightarrow V1$ | B <sub>1</sub>  | V1   | Free              | V1  | $\overline{P}_1$  |   |
| $M \rightarrow V2$ | B <sub>2</sub>  | V2   | $\overline{B}_1$  | V2  | $\overline{B}_2$  |   |
| $M \rightarrow V3$ | B <sub>3</sub>  | V3   | $\overline{B}_2$  | N3  | $\overline{B}_3$  |   |
| $M \rightarrow V4$ | B <sub>4</sub>  | V4   | $\overline{B}_3$  | V4  | $\overline{B}_4$  |   |
| $M \rightarrow V5$ | B <sub>5</sub>  | V5   | $\overline{B}_4$  | V5  | $\overline{B}_5$  |   |
| V6                 | Free            | ¥ V6 | B <sub>5</sub>    | V 6 | Free              |   |
| M 7 V 7            | RV <sub>1</sub> | V7   | $\overline{RV}_2$ | 7V7 | $\overline{RV}_3$ |   |
| M/                 | M               |      | M                 | 1   |                   |   |
|                    | itial           |      | After             |     | After             |   |
|                    | tate            |      | steps             |     | steps             |   |
| Ę                  | step 1          | 2,   | 3,81              |     | 2,3,41            | L |

State 1

State 0

State 2

| VO  | PV                             | V0  | $\overline{PV}$       |
|-----|--------------------------------|-----|-----------------------|
| V1  | $\overline{B}_1$               | V1  | Free                  |
| V2  | B <sub>2</sub>                 | V2  | $\overline{B}_1$      |
| V3  | $\overline{B}_3$               | V3  | $\overline{B}_2$      |
| V4  | $\overline{B}_4$               | V4  | $\overline{B}_3$      |
| V 5 | $\overline{B}_5$               | V 5 | B <sub>4</sub>        |
| V6  | Free                           | V6  | B <sub>5</sub>        |
| V7  | $\overline{\mathbb{RV}}_{k-1}$ | V7  | $\overline{RV}_{k-1}$ |
| • / | <u></u>                        |     |                       |
| k   | -1 odd                         | k   | -1 even               |
|     |                                |     |                       |

Figure 6a. Data flow in external Figure 6b. block processing

Figure 6b. Two possible end states after external block processing is complete

In the allocation of the vector registers, six (V1-V6) are assigned to the reduction block, of which five contain the actual data of the block (q=5) with a sixth (labeled free) being used to allow accumulation into the block of  $\overline{B}$  vectors. One of the remaining two vector registers (V7) is used for holding the row vectors  $RV_i$ ,  $1 \le i \le k-1$  as they are read one at a time from memory. The other (V0) is used to contain the product vector  $\overline{PV}$  which is computed from  $\overline{RV}_i$  by a scalar multiplication.

When all external k-1 row vectors are processed, the contents of the vector registers will be in one of two states as depicted in Figure 6b. Which k-1 end state results is governed by whether the number of k-1 row vectors processed is odd or even.

There are two similar code sequences used in processing row vectors:

- 1) accumulation of the  $\overline{B}_1$ - $\overline{B}_5$  block into vector registers V2-V6;
- 2) accumulation of the block into vector registers V1-V5. This accumulation is depicted in Figure 6a by "  $\stackrel{+}{\Rightarrow}$  " symbol. Initially vector registers V1-V5 must be loaded with the reduction block from main memory, which is depicted by the " M+" symbol. Then the first row vector RV<sub>1</sub> (Figure 5) must be loaded into V7 from main memory. Then the last scalar of scalar group one (SG<sub>1</sub>) is loaded and the product of  $\overline{\text{RV}}_1$  and the scalar is placed in V0 ( $\overline{\text{PV}}$ ) which is depicted by the " \*+ " symbol. This product is then accumulated with  $\overline{\text{B}}_5$  (in V5) and directed to V6. This row vector is then used with the remaining four scalars working up the scalar group. This leaves V1 free to propagate results in the reverse direction with the next row vector.

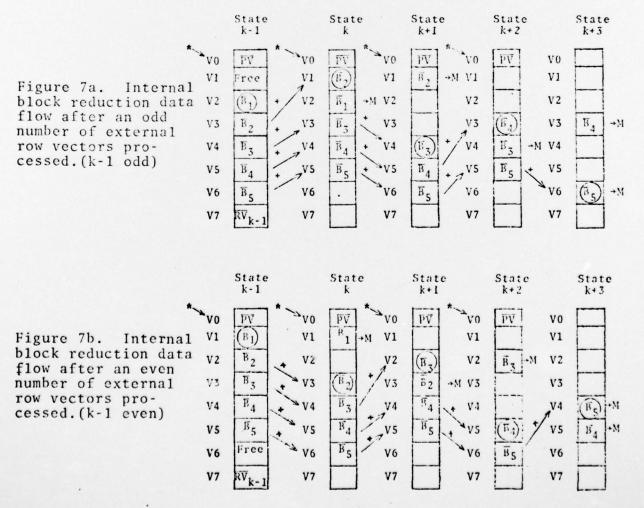
What follows is the symbolic layout of vector instructions that reflect the operation sequence of the external row block processing (refer to Figures 5 and 6a). Only the pertinent instructions have been included. Scalar code necessary for address generation and loop control have been omitted and the braces indicate chained instructions.

| i+1<br>Load V1,V2,V3,V4,V5 with  | Initialize row vector and scalar group counter B1,B2,B3,B4,B5, respectively                            |
|--|--|
| ROW_BLK_LOOP Load SG   | load the i <sup>th</sup> scalar group  |
| $\begin{cases} V7 + RV_{i} \\ V0 \leftarrow S_{5} * V7 \\ V6 \leftarrow V5 - V0 \end{cases}$             | load the i <sup>th</sup> row vector create $\overline{B}_5$ product vector accumulate $\overline{B}_5$ |
| \begin{cases} \text{V0+S}_4 \times \text{V7} \\ \text{V5+V4-V0} \end{cases}                              | create $\overline{\mathbf{B}}_4$ product vector accumulate $\overline{\mathbf{B}}_4$                   |
| \{\varphi 0 \lefta S \ 3 \times \varphi 7 \\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\                            | create $\overline{B}_3$ product vector accumulate $\overline{B}_3$                                     |
| \begin{cases} \text{V0+S}_2*\text{V7} \\ \text{V3+V2-V0} \end{cases}                                     | create $\overline{\mathbb{B}}_2$ product vector accumulate $\overline{\mathbb{B}}_2$                   |
| \(\frac{\v0+\S_1*\v7}{\v2+\v1-\v0}\)   | create $\overline{\mathbb{B}}_1$ product vector accumulate $\overline{\mathbb{B}}_1$                   |
| <b>+</b>   |  |
| <pre>If i = k-1 JUMP TO ODD_ROW_DRAIN</pre>  | check for completion of external row vectors   |
| i+i+1  | move on to the next one  |
| <b>+</b>   | + 16   |
| Load SG <sub>i</sub>   | load the ith scalar group  |
| (V7+RV;  | load the i <sup>th</sup> row vector  |
| $\begin{cases} V7 \leftarrow RV_{1} \\ V0 \leftarrow S_{1} \neq V7 \\ V1 \leftarrow V2 - V0 \end{cases}$ | create $\overline{\mathbb{B}}_1$ product vector accumulate $\overline{\mathbb{B}}_1$                   |
| \begin{pmatrix} \text{V0+S}_2*\text{V7} \\ \text{V2+V3-V0} \end{pmatrix}                                 | create $\overline{B}_2$ product vector accumulate $\overline{B}_2$                                     |
| \begin{pmatrix} \text{V0+S}_3*\text{V7} \\ \text{V3+V4-V0} \end{pmatrix}                                 | create $\overline{B}_3$ product vector accumulate $\overline{B}_3$                                     |
| \begin{cases} \text{V0+S}_4 * \text{V7} \\ \text{V4+V5-V0} \end{cases}                                   | create $\overline{B}_4$ product vector accumulate $\overline{B}_4$                                     |
| \\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\   | create $\overline{B}_5$ product vector accumulate $\overline{B}_5$                                     |
| •  |  |
| TO I I I WAS TO THE PART TO THE  |  |

If i = k-1 JUMP TO EVEN\_ROW\_DRAIN check for completion of external row
vectors i+i+1 move on to the next one JUMP TO ROW\_BLK\_LOOP

The column block reduction uses a similar scheme with the only alteration being where in memory the matrix data is coming from.

At this stage of the algorithm all the external row vectors have been processed with the contents of the vector registers in one of the two k-1 states depicted in Figure 6b. As discussed earlier, the rest of the row vectors come from inside the reduction block to complete the blocks reduction. In fact,  $\overline{B}_1$  is now completely reduced and will be employed as the next row vector to further reduce  $\overline{B}_2$ ,  $\overline{B}_3$ ,  $\overline{B}_4$  and  $\overline{B}_5$ . Figures 7a and b show the internal block reduction data flow starting from either of the k-1 ending states of the external block reduction. This internal block reduction is referred to as draining the block.



At each drain state the completion of a  $\overline{B}$  vector is indicated by a circle. In the subsequent states, as the rest of the  $\overline{B}$  vectors are completed they are successively returned to memory (" $\rightarrow M$  symbolizes the store of the vector register to memory). The odd and even k-1 states give rise to two block drain codes.

What follows is the symbolic layout of vector instructions necessary for the draining of a row block starting from the odd k-1 state. This data flow is depicted in Figure 7a. Also refer to Figure 5. The draining starting from the even k-1 state is similar in spirt as is the draining of a column reduction block. Again, scalar code for address generation has been omitted for the sake of clarity and the braces indicate chained or concurrent instruction sequences.

```
ODD DRAIN
                                       Move to next scalar group (i=k-1 at entry)
                 i +i+1
                                       Load the scalar group
                 Load SGi
                V0+52*V2
                                       Create B product vector
                                      Accumulate \overline{B}_2 (\overline{B}_2 now fully reduced)
                V0+S3*V2
                                       Create B, product vector
                V3+V4-V0
                                       Accumulate B3
                (V0+S4*V2
                                       Create B4 product vector
                V4+V5-V0
                                       Accumulate B4
                [V0+S5*V2
                                       Create B<sub>5</sub> product vector
                V5+V6-V0
                                       Accumulate B5
                (Store V2 containing \mathbb{F}_1 to memory (optional pivot before store)
                                       Move to next scalar group
                Load SG;
                                      Create B<sub>5</sub> product vector
                V0+S5*V1
                V6+V5-V0
                                       Accumulate \overline{B}_5
                                       Create B<sub>4</sub> product vector
                \( \v0+\s_4*\v1
                V5+V4-V0
                                       Accumulate B<sub>4</sub>
                                       Create \overline{\mathrm{B}}_3 product vector
                V0+S3*V1
                                       Accumulate \overline{B}_3 (\overline{B}_3 now fully reduced)
                (V4+V3-V0
                (Store V1 containing \overline{B}_2 to memory (optional pivot before store)
                 i+i+1
                                       Move to next scalar group
                 Load SG;
                 V0+S4*V4
                                       Create B4 product vector
                                       Accumulate \overline{B}_4 (\overline{B}_4 now fully reduced)
                V3+V5-V0
                V0+S5*V4
                                       Create B<sub>5</sub> product vector
                V5+V6-V0
                                       Accumulate B,
                Store V4 containing \mathbb{F}_3 to memory (optional pivot before store)
                 i+i+1
                                       Move to next scalar group
                 Load SG;
                 V0+S5*V3
                                       Create B, product vector
                V6+V5-V0
                                       Accumulate \overline{B}_5 (\overline{B}_5 now fully reduced)
                 Store V3 containing \overline{\mathbb{B}}_4 to memory (optional pivot before store)
                 Store V6 containing \overline{\mathbb{B}}_5 to memory (optional pivot before store)
                 Row block reduction now complete and returned to memory.
```

Once all the row vectors comprising the block have been returned to memory the block reduction is complete. Depending on whether row or column pivoting is desired an optional pivot multiplication can be inserted before the vector stores in the appropriate drain routine.

Since there is only one path to the Cray-1 main memory from the computational section the scalar fetches should be placed in such a way so as to avoid conflicting with the block vector stores and thus causing a halt to instruction issuing.

It is easy to see that when a row vector is read from main memory each element is employed in five multiplies giving rise to the asymptotic limit of  $\rho$  = 5 as  $p \rightarrow \infty$ .

#### IV. Commentary

## A. Further algorithmic considerations

The problem of pivoting has been ignored in this report, although it involves data restructuring and hence can influence data flow. It would be considered when the more general problem of data formatting was being investigated. Here, one would be concerned with the formatting of  $\underline{A}$ ,  $\underline{L}$ , and  $\underline{U}$  in the disc, main memory, and vector registers.

Since the disc is read and written sequentially it must share at least a common block format with main memory. However, the data may be reformatted between memory and the registers, since a matrix block in memory may be accessed both row- and columnwise. Also,  $\underline{A}$  and  $\underline{L}$   $\underline{U}$  need not be identically formatted; the first may be determined by user convenience whereas  $\underline{L}$  and  $\underline{U}$  are internal to the equation solution algorithm. The result may be that the alternate row- and column-strip access of Figure 3 may be inconvenient; this would not seriously impact the interior loop where the reduced memory accesses are achieved.

## B. Speedup by architectural modifications

#### 1. Introduction

With the processor-memory path busied between 1/4 and 1/5 of the time in support of the inner loops, the memory is free to communicate with the instruction parcel buffers, the B and T registers, and (most importantly) the backing store the majority of the time.

We have shown that lack of disc capacity can impede computation

overall; however even if solution time becomes I/O dominated so that I/O traffic is maximized, it can be readily shown that memory will be occupied at most m/144 of the time emptying I/O buffers. Adding this to the above fractions, it seems safe to assume that 1/2 - 2/3 of the memory bandwidth is unused for all purposes presently accounted for.

In the following sections, we suggest architectural modifications to utilize this bandwidth to speedup the equation solution.

### 2. Register control

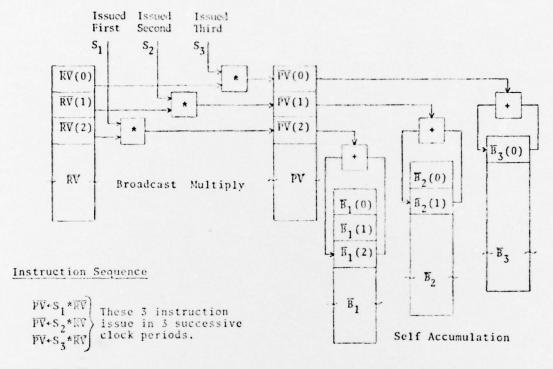
Presently, access to elements of a vector register are controlled by the register with a single counter. If the access control were moved from the vector register to the functional unit, the same vector register could be concurrently accessed by multiple functional units. This would permit self accumulation of a vector register into itself, allowing, for example, incrementation as  $V1 \leftarrow V1 + C$ . The register propagation scheme of the proposed algorithm where one vector register was added to another could be avoided, allowing a q of 6 and a further reduction in memory accesses.

### 3. Expanded functional units

A more important consequence of excess memory bandwidth and modified register control would be the ability to add functional units for increased parallelism. If each multiply-add unit required the same fraction of memory bandwidth as determined above, possibly two or three units could be added without interference. One possibility for accomplishing this without changing

instruction formats and thereby making present codes upward compatible is now described.

The data flow is symbolically diagrammed in Figure 8 with the vector instruction sequence that produced it.



 $\overline{B}_1+\overline{B}_1$ -PV This issues at the chain slot arrival of data from the  $S_1$  multiply.  $\overline{B}_2+\overline{B}_2$ -PV This issues at the next chain slot from the  $S_2$  multiply.  $\overline{B}_3+\overline{B}_3$ -PV Issues at  $S_3$  multiply chain slot.

Figure 8. Symbolic data flow of parallel inner product.

Essentially, three inner products are computed in parallel with a clock period displacement in the elements being processed. The first multiply issued would be one clock period ahead of the second one issued. The second in turn would be one clock period ahead of the third. The first product to arrive at  $\overline{PV}(0)$  (The notation  $\overline{PV}(0)$  refers to element zero for vector register  $\overline{PV}$ ) would signal chain slot time for the waiting  $\overline{B}_1$  accumulation instruction. This

instruction would issue with the product being fed into the adder. In the next clock period  $\overline{PV}(1)$  would receive the first multiply's second product which would move on to  $\overline{B}_1$ 's adder, and so forth. Also, in this clock period,  $\overline{PV}(0)$  would receive the second multiply's first product thereby signaling chain slot time for the now waiting  $\overline{B}_2$  accumulation instruction, causing it to issue. In the next clock period the third multiply's first product will arrive at  $\overline{PV}(0)$  initiating the  $\overline{B}_3$  accumulation. In succeeding clock periods, three products will simultaneously arrive at  $\overline{PV}$  and then be passed on to the three adders for  $\overline{B}$  vector accumulation.

This scheme is not without its drawbacks. The ordering and placement of vector instructions has to be critically observed noting all instruction issue delays to insure correct chain slot time synchronization. When using a vector register  $(\overline{PV})$  in this multi-chain through mode, missing a chain slot time would produce an entirely different calculation. Furthermore, external interupts (I/0, timer, etc.) would have to be disallowed during a multi-store use of any vector register, thereby anticipating the invocation of multi-chain through mode by subsequent, as yet unseen, vector instructions.

# 4. Scalar register chaining

When intermediate results of a chained computation are not required, it is undesireable to allow them to occupy a vector register. One technique might be to allow chaining through scalar registers. When a vector result is passed to a chain through

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|       | data flows involved in solving a full equation system on the Cray-1. This involves study of the I/O and memory-processor path traffic vis-a-vis the    |   |  |
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modifying and expanding the processor architecture.

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scalar register, it would simply move on to the next functional unit of the chained instruction sequence. The following hypothetical instruction sequence is an example of using a scalar register in this manner.

S1+ S2\*RV

Begin production of product elements

V6+ V5+S1

Accumulate these products

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